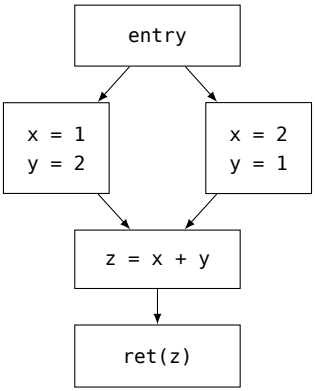
Data-flow analysis

Data-flow analysis

- Static
- Global (whole CFG)
- Control-flow dependent
- Computes run-time properties
- Unified formal model and theory

Applications

- Reaching definitions (use-def links)
- Live-variable analysis
- Constant propagation
- Constant subexpression elimination
- Dead code elimination



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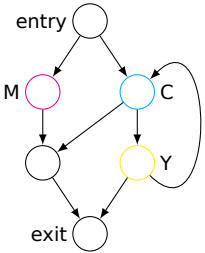

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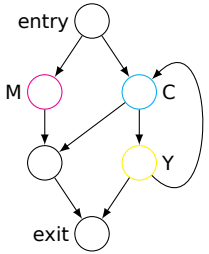
Data-flow framework

- Flow graph $G = \langle V, E, v_{entry}, v_{exit} \rangle$
- Direction of analysis $D \in \{\downarrow, \uparrow\}$
- Meet-semilattice $\langle L, \wedge \rangle$ with upper bound
- Transfer functions $f_{v \in V} : L \to L$
- Boundary condition $in_0(v) = out_0(v) = \top$



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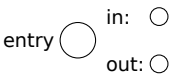

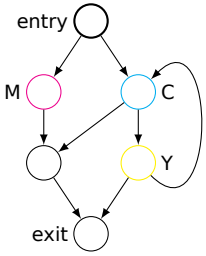

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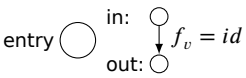

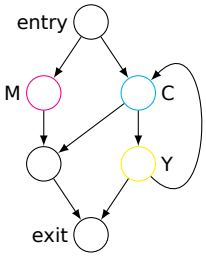

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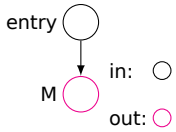

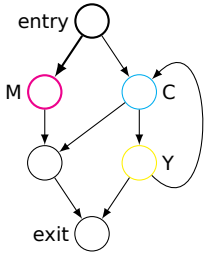

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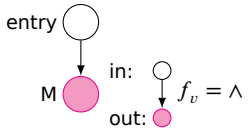

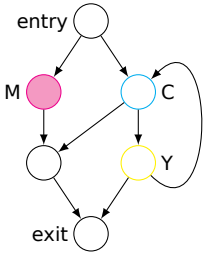

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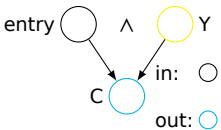

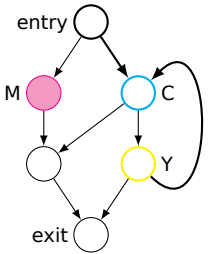

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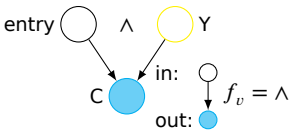

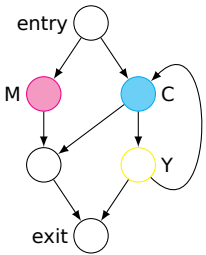

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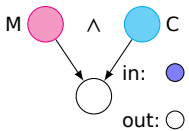

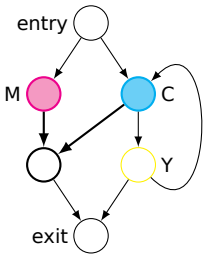

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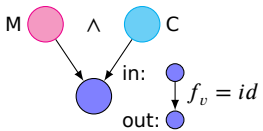

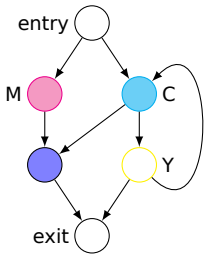

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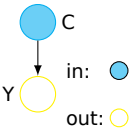

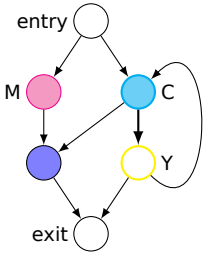

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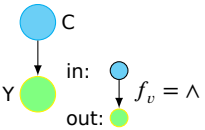

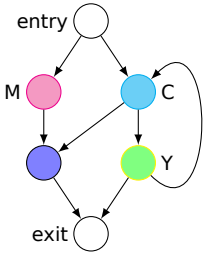

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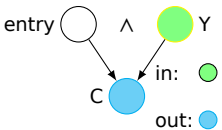

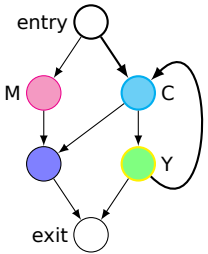

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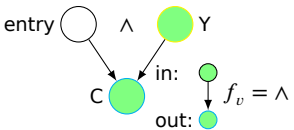

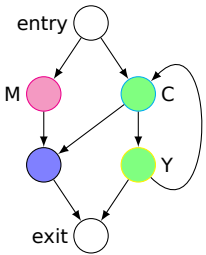

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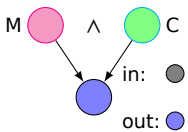

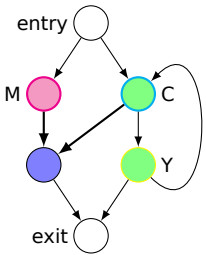

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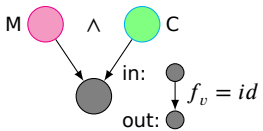

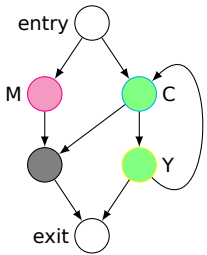

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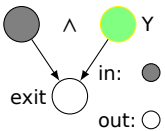

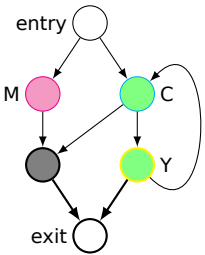

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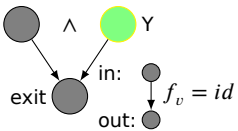

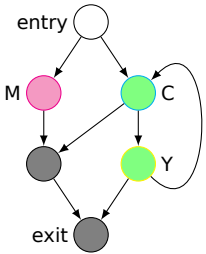

Meet-semilattice

Binary operation $\wedge$ (*meet*)

- $x \wedge x = x$ (*idempotency*)
- $x \wedge y = y \wedge x$ (*commutativity*)
- $(x \wedge y) \wedge z = x \wedge (y \wedge z)$ (*associativity*)

Partial order $\leq$

- $x \leq x$ (*reflexivity*)
- $x \leq y \ \& \ y \leq z \Rightarrow x \leq z$ (*transitivity*)
- $x \leq y \ \& \ y \leq x \Rightarrow x = y$ (*antisymmetry*)

Semilattice $\langle L, \wedge \rangle$ [1] [2]

- $x \leq y \Leftrightarrow_{def} x \wedge y = x$
- $x < y \Leftrightarrow_{def} x \wedge y = x \ \& \ x \neq y$

[1] Do partial order conditions hold for this definition of $\leq$ via $\wedge$?

[2] Is it possible to define semilattice $\langle L, \wedge \rangle$ having only partial order $\langle L, \leq \rangle$?

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Upper bound

$$\exists \bot \in L : \forall x \in L : \bot \wedge x = \bot \; (\bot \leq x)$$

Lower bound

$$\exists \top \in L : \forall x \in L : \top \wedge x = x \; (x \leq \top)$$

Semilattice height

$$H_L = max\{|x_1 > x_2 > \ldots \in L|\}$$

Descending chain condition

$$\forall x_1 > x_2 > \ldots \in L : \exists k : \nexists y \in L : x_k > y$$

Semilattice product

$$\langle A, \wedge_A \rangle \times \langle B, \wedge_B \rangle = \langle A \times B, \wedge \rangle,$$
$$(a, b) \wedge (a', b') = (a \wedge_A a', b \wedge_B b')$$

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Power set of S

$L = 2^S, \wedge = \cup$ or $\cap$

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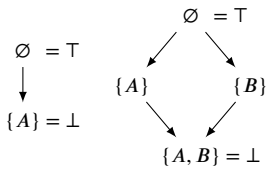

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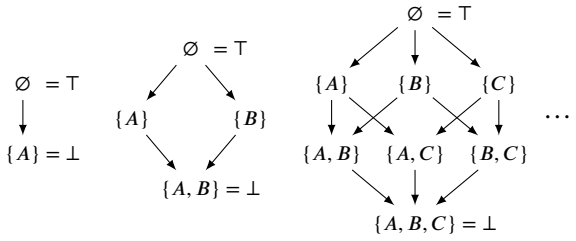

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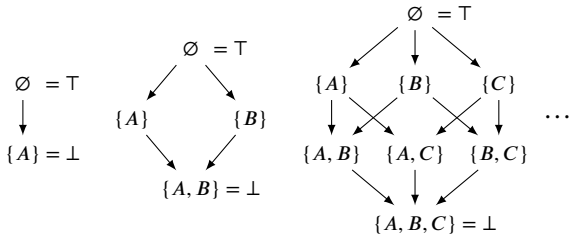


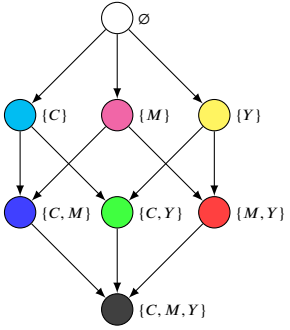
Examples

Power set of S

$L = 2^S, \wedge = \cup$ or $\cap$

CMYK

$L = 2^{\{C,M,Y\}}, \wedge = \cup$



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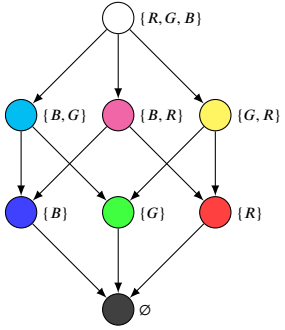
RGB

$L = 2^{\{R,G,B\}}, \wedge = \cap$



Examples

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Natural numbers

$L = \mathbb{N}_0 \cup \{\top\}, x \wedge y = min(x, y)$

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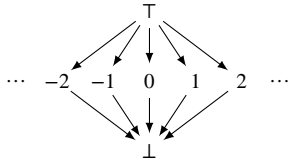

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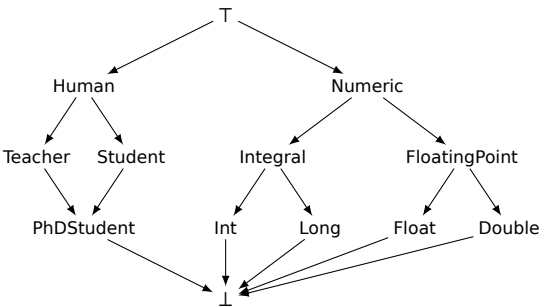
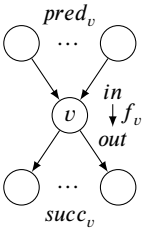
Program type hierarchy

$L = Types, x \leq y \Leftrightarrow x <: y$



Data-flow framework

- Flow graph $G = \langle V, E, v_{entry}, v_{exit} \rangle$
- Direction of analysis $D \in \{\downarrow, \uparrow\}$
- Meet-semilattice $\langle L, \wedge \rangle$ with upper bound
- Transfer functions $f_{v \in V} : L \to L$
- Boundary condition $in_0(v) = out_0(v) = \top$



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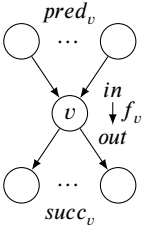

Data-flow equations

$D = \downarrow$	$D = \uparrow$
$in_0(v) = out_0(v) = \top$	$in_0(v) = out_0(v) = \top$
$in_i(v) = \bigwedge_{x \in pred_v} out_i(x)$	$out_i(v) = \bigwedge_{x \in succ_v} in_i(x)$
$out_i(v) = f_v(in_i(v))$	$in_i(v) = f_v(out_i(v))$

Maximum Fixed Point (MFP)

Maximum solution among all solutions S

$out_S(v) \leq out_{MFP}(v) \quad | \quad in_S(v) \leq in_{MFP}(v)$

Convergence conditions

- Monotonicity of transfer functions f_v
- Meet-semilattice $\langle L, \wedge \rangle$ with descending chains condition

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Transfer functions

Monotone function f on $\langle L, \leq \rangle$

$$x \leq y \Rightarrow f(x) \leq f(y)$$

Monotone function f on $\langle L, \wedge \rangle$ [3]

$$f(x \wedge y) \leq f(x) \wedge f(y)$$

Distributive function f on $\langle L, \wedge \rangle$

$$f(x \wedge y) = f(x) \wedge f(y)$$

Data-flow equations

$D = \downarrow$	$D = \uparrow$
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- Meet-semilattice $\langle L, \wedge \rangle$ with descending chains condition

[3] Prove the equivalence of given monotone function definitions on $\langle L, \leq \rangle$ and on $\langle L, \wedge \rangle$.

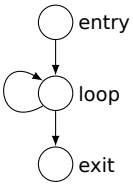
Examples of divergent analysis

Monotonicity of transfer functions

$$L = \{T, F\}, F \leq T$$
$$f_{entry} = f_{exit} = id$$
$$f_{loop}(x) = \neg x$$

Descending chain condition [4]

$$L = \mathbb{R}_0^+ \cup \{\top\}, \wedge = min$$
$$f_{entry}(x) = 1$$
$$f_{loop}(x) = x/2$$
$$f_{exit} = id$$



[4] Can there be a semilattice with unlimited height which satisfies descending chain condition?

Precision

Meet Over Paths (MOP) [5]

Precise solution over all paths $v_{entry} \to \cdots \to v$

$$out_{MOP}(v) = \bigwedge_{v_{entry} \to \cdots \to v} f_v(\ldots(f_{v_{entry}}(\top))\ldots)$$

MFP safety

$$out_{MFP}(v) \leq out_{MOP}(v)$$

[5] Here we only consider forward-flow analysis $D = \downarrow$, the case of backwards-flow analysis $D = \uparrow$ is the same.

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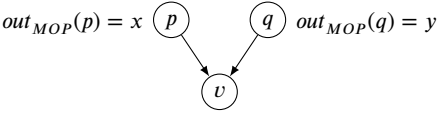

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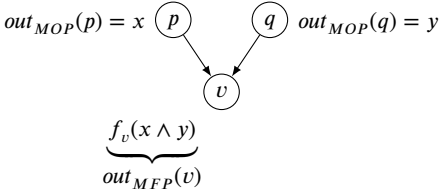

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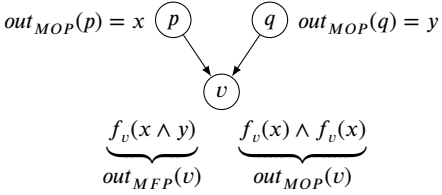

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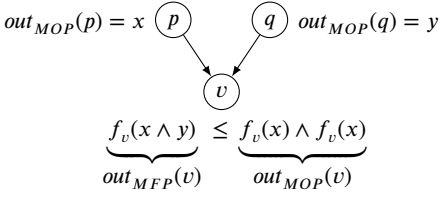

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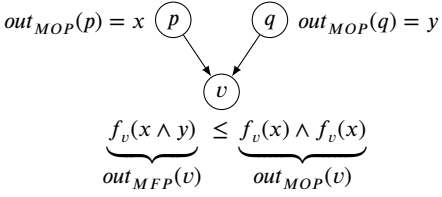

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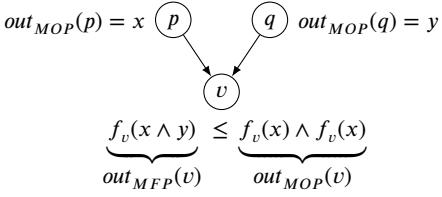
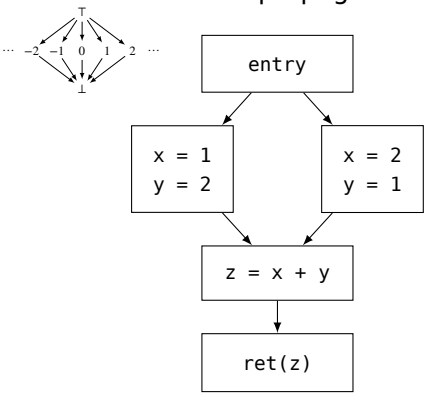


Constant propagation



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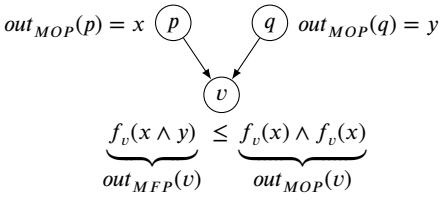

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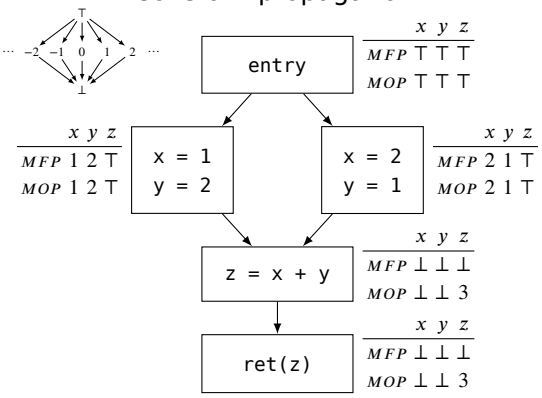

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Control-flow graph

- $CFG = \langle B, E, entry, exit \rangle$
- Every block $b \in B$ contains exactly one operation
- V — set of varbles in a program
- $def_v \subseteq B$ — set of *assignments* into variable $v \in V$
  (e.g. v = 3)
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- $L = 2^S, \wedge = \cup$ or $\cap$
- $f_b(x) = gen_b \cup (x \setminus kill_b)$
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- $\langle L, \wedge \rangle$ — finite semilattice
- f_b — distributive functions [7]
- Analysis *always* converges to precise solution

[7] Prove distributivity of f_b in gen-kill form.

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Reaching definitions

$L = 2^B, \wedge = \cup, D = \downarrow$

b	$\in def_v$	$\notin def_v$
gen_b	$\{b\}$	$\varnothing$
$kill_b$	def_v	$\varnothing$

Live-variable analysis

$L = 2^V, \wedge = \cup, D = \uparrow$

gen_b	$\{v \mid b \in use_v\}$
$kill_b$	$\{v \mid b \in def_v\}$

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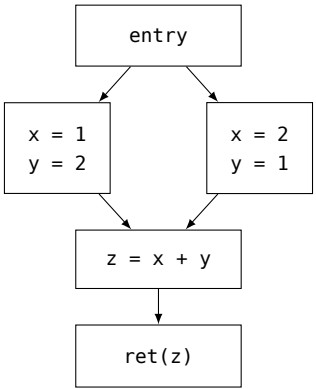
Conclusion

Benefits

- Global static analysis
- Universal theoretical model
- Straightforward implementation
- gen-kill formalism guarantees convergence and precision

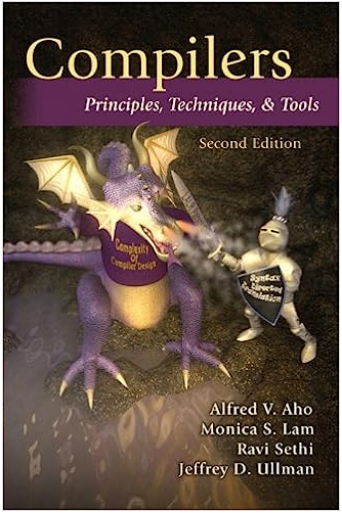
Drawbacks

- Result gets invalidated after optimizations
- Analsyses do not compose quite efficiently
- Convergence and precision are not guaranteed in general



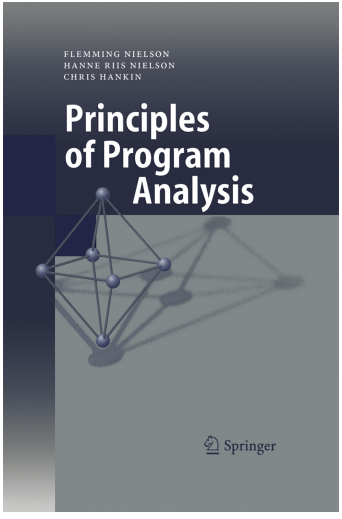
Further reading

A. V. Aho, M. S. Lam, R. Sethi, and J. D. Ullman.
Compilers: Principles, Techniques, and Tools, 1986
Introduction to Data-Flow Analysis



Further reading

N. Flemming, H. R. Nielson, and C. Hankin.
Principles of program analysis. 2015
Data Flow Analysis



Thank you for attention